



Application of branching cells to QoS aware service orchestrations

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Branching Cells for Asymmetric Event Structures

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Abstract

By allowing service calls to be guarded by contexts, Asymmetric Event Structures (AES for short) and contextual nets are a convenient framework to model composite Web services or service orchestrations. We equip AES with *QoS domains* as a framework to capture a number of QoS metrics and their combination. We use the resulting model to formalize QoS-based late service binding in composite services. When subject to QoS-based late service binding, composite services may be non-monotonic with respect to QoS, meaning that strictly improving the QoS of a service may strictly decrease the end-to-end QoS of the composite service, an embarrassing feature for QoS-aware management; we study this issue. Branching cells of AES play a central role in this study.

Keywords:

1. Introduction

Workflow nets [20, 21, 22] have been advocated as a concurrent model for workflows. Queries submitted to the workflow are captured by tokens circulating in the workflow net. These tokens are enriched with the data returned by the called services and, when exiting the workflow net, tokens carry the result of the workflow in response to the submitted query. Formally speaking, executions of workflow nets are conveniently captured by Prime Event Structures (PES for short) with causality and symmetric binary conflict [14], capturing the successive choices made between alternative continuations of the workflow execution.

It is, however, very natural in service orchestrations, to guard service calls by *contexts*, i.e., conditions on variables, states, or attributes, that are only checked but not modified or consumed. Indeed, rich workflow, orchestration, or choreography languages (such as BPEL [19] or Orc [12, 13]), use contexts in

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addition to resources to guard service calls. The basic notions of causality and conflict offered by safe Petri nets and associated PES, do not encompass the notion of context. The simplest extension of Petri nets to handle contexts is by adding *read arcs*, giving rise to *contextual nets* and their associated framework of Asymmetric Event Structures (AES) [4]. Indeed, Orc concurrent semantics was defined in [18] using AES.

Since the world of services is open, several services often compete at offering equivalent functions, albeit under different implementations or with different Quality of Service (QoS). QoS metrics typically include timing performance, availability, security, reliability, vulnerability, cost, and variations thereof. Optimizing orchestrations for QoS has been the subject of a large literature, see for example [9, 3, 23, 25]. Part of this literature is devoted to off-line and static optimal selection of services among competing alternatives. While this is a relevant approach for a close world of predefined services, it is not appropriate for an open world where available services may not be known in advance when the composite service is defined. QoS based *late service binding* [10, 8] has proposed instead, which consists, for an orchestration, in dynamically selecting at run time, based on QoS, which service will actually be called to provide the due function at a given stage of the orchestration. This naturally gives rise to complex competitions between multiple threads of services that could share some services for calling, a typical source of *confusion* in nets, i.e., situations in which conflicts are not local to a single place, thus reflecting that choice is among alternatives involving competing groups of called services.

To address QoS based management of composite services, we developed in previous work a framework of *soft probabilistic QoS contracts* for service orchestrations [15, 16, 17]. In this framework, the QoS of each called service with its different dimensions, is considered probabilistic. A QoS contract thus consists of a probability distribution that each service exposes (as part of its Service Level Agreement, SLA). The service meets its obligations as long as it behaves at least as good as stated in its contract—here “at least as good as” refers to *stochastic ordering* of random variables, as widely used in econometrics. Statistical tests were proposed in [16] to monitor the possible violation of probabilistic QoS contracts and a probabilistic contract composition method was proposed in [15, 16] for the particular case of latency, and in [17] for the general QoS case. The issue of monotonicity was first pointed out in [16]. It may be, for an orchestration, that a service improving its QoS still results in a degradation for the end-to-end QoS of the orchestration, an embarrassing feature when using contracts or performing late service binding. Such orchestrations are called non-monotonic. The first study of monotonicity was reported in [6], for the particular case of latency and for orchestrations involving no confusion. Besides [6], the above references targeted Web services audience and, thus, the formal side of this work was not detailed.

In this paper we formally study QoS-based late service binding in service orchestrations, for orchestrations modeled as AES with arbitrary confusion and for general, possibly multi-dimensional, QoS.

In companion paper [1], choices in AES with confusion are studied. This development serves us in this paper as a basis for studying QoS aware management of service orchestrations with emphasis on late service binding. To discuss an example, however, we feel it more comfortable to use safe contextual nets.

Companion paper [1] recalls in its appendix how to systematically construct, for any safe contextual net, the AES of all its executions.

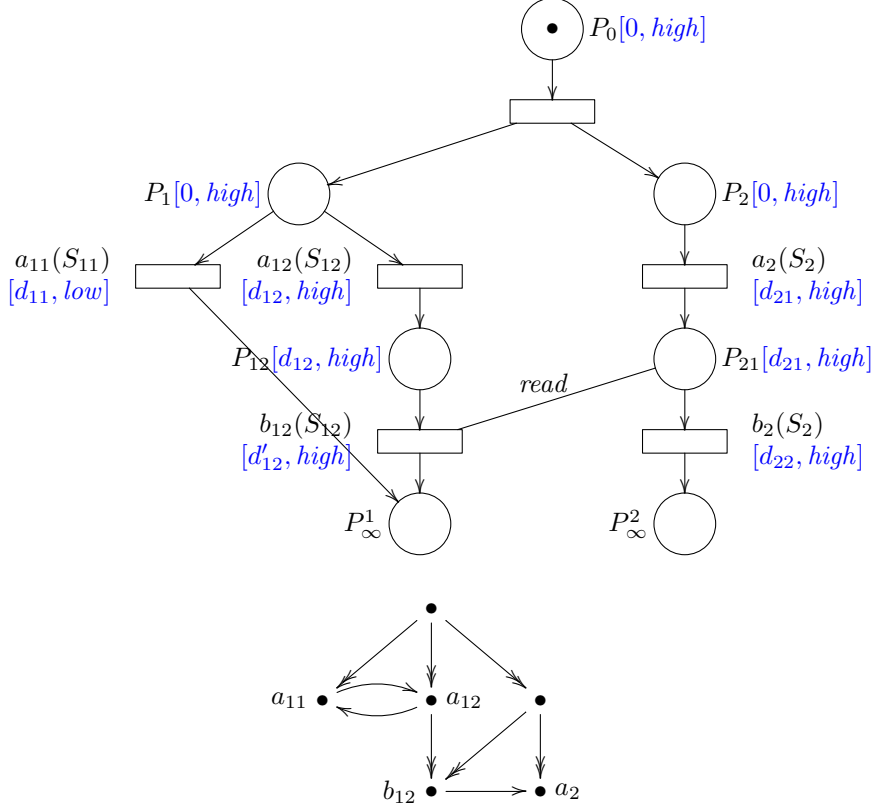


Figure 1: Top: A simple orchestration, described as a safe contextual Workflow net, where read arcs are depicted as nondirected arcs. Blue labels refer to QoS. Bottom: AES of its executions; double arrows arcs depict the causality relation and single arrow arcs depict the additional asymmetric conflict relations.

Running Example 1. Figure 1 shows a toy example that will serve us as a support throughout this paper. For this discussion we use the example in its net form (top of the figure). For the moment, also, we ignore the blue labels. Each query submitted to the orchestration is represented by a fresh token entering the input place P_0 . Responses to this query are collected at the return store of the orchestration, consisting of the two output places P_{∞}^1 and P_{∞}^2 . The reception of a query triggers the launching of two parallel threads, beginning at the places P_1 and P_2 .

Thread starting at P_2 calls service S_2 , shown by event a_2 ; the execution of service S_2 is not atomic; S_2 silently operates while the token sits in place P_{21} ; when terminating, shown by event b_2 , service S_2 outputs a token in place P_{∞}^2 .

Thread starting at P_1 can nondeterministically call service S_{11} ; the associated service call is captured by event a_{11} ; service S_{11} outputs a token in place P_{∞}^1 when terminated. As an alternative, thread starting at P_1 can call service S_{12} ; the associated service call is captured by event a_{12} ; the execution of service S_{12} is not atomic; S_{12} silently operates while the token sits in place P_{12} and

outputs a token in place P_∞^1 when terminated; S_{12} , however, requires for its completion to know a context consisting of an attribute (say, an *Id*) held by the second thread P_2 . This attribute may be consumed when terminating service S_2 , shown by event b_2 , thus preventing S_{12} from terminating in this case (event b_{12} cannot be produced). Note that the failure of sites to respond is not atypical in the world of services.

This orchestration involves two choices following places P_1 and P_2 and one synchronization at event b_{12} . The choice occurring in P_1 captures late service binding at run time and we wish to perform it by selecting the alternative offering best QoS. \square

To this end, we develop an algebraic formalization of QoS, modeling how QoS quanta associated with service calls contribute to the end-to-end QoS of the orchestration. Quite often, several metrics are jointly considered, making QoS multi-dimensional and, thus, possibly only partially ordered.

Running Example 2. Focus again on Figure 1 and consider now its blue labels. Each label is a pair [latency, security level], thus capturing a two-dimensional QoS. Latencies are ordered as usual, where smaller means better. Security levels are ordered as *high* < *low*, where, again, smaller means better. The two-dimensional QoS is ordered by the product order. The execution of the workflow of Figure 1 is controlled by this two-dimensional QoS. \square

Having done this, we can now explain how QoS-based late service binding is performed for the considered workflow.

Running Example 3. A query enters the orchestration with zero latency and *high* security level.

- The first transition launches the two threads and we assume it takes no time and has no impact on security level. Therefore, when entering places P_1 and P_2 , the token keeps the same QoS attributes.
- Once the second thread is launched, a_2 fires, which causes a latency d_{21} while keeping security level *high*. Then, b_2 fires and outputs at place P_∞^2 a response for the orchestration with QoS $q_\infty^2 = [d_{21} + d_{22}, \text{high}]$.
- Focus next on the first thread and the choice occurring at place P_1 . Event a_{11} causes an increment in QoS as indicated on the figure, and similarly for a_{12} .
 - Suppose that $d_{12} \leq d_{11}$. Since *high* is preferred to *low* regarding security level, QoS-based late service binding favors S_{12} over S_{11} , so the latter is not called. Hence, a_{12} get fired and the token reaches place P_{12} with latency $0 + d_{12} = d_{12}$ and security level $\max(\text{high}, \text{high}) = \text{high}$. If its context is available (meaning that a token still sits at P_2), service S_{12} terminates in zero time with no degradation of the security level, which results in a response of the orchestration with QoS $q_\infty^1 = [d_{12} + d'_{12}, \text{high}]$. This occurs if $d_{12} \leq d_{21}$. The response of the orchestration in this case consists of the two concurrent responses from S_{12} and S_2 and the end-to-end QoS for the orchestration is

$$\bigvee \{q_\infty^1, q_\infty^2\} = [\max(d_{12} + d'_{12}, d_{21} + d_{22}), \max(\text{high}, \text{high})], \quad (1)$$

i.e., the “worst” QoS of the two responses. If, however, the context of b_{12} is not available ($d_{12} > d_{21}$), then S_{12} never terminates (the token is blocked in P_{12}) and then only S_2 responds with a resulting end-to-end QoS equal to q_∞^2 .

- Suppose instead that $d_{12} > d_{11}$ and security level of a_{12} is also *low*. Then, QoS-based late service binds favors S_{11} over S_{12} . S_{11} terminates and outputs a response with QoS $[d_{11}, low]$. On the other hand, S_2 performs as for the other case, which results in an end-to-end QoS for the orchestration equal to

$$\bigvee \{q_\infty^1, q_\infty^2\} = [\max(d_{12}, d_{21} + d_{11}), \max(high, low)] \quad (2)$$

with $\max(high, low) = low$.

- The situation is less straightforward if a_{12} has security level *high* but $d_{12} > d_{11}$, making the two QoS incomparable (with respect to the product order). Two strategies are then possible. One possibility is to select nondeterministically one of the two alternatives (since no one outperforms the other). The other possibility is to change the order used in comparing QoS: one could weight and then add the two metrics; or one could give priority, say, to security over latency. For both cases we get a total order for the two-dimensional QoS.

This gives a picture of how QoS controls executions of this workflow. □

Running Example 4. Let us come back to the original product order with QoS situation $[d_{11}, low]$ for a_{11} and $[d_{12}, low]$ for a_{12} , with $d_{11} < d_{12}$, so that S_{11} is preferred over S_{12} . Suppose service S_{12} improves its latency by reducing d_{12} below d_{11} while, still, leaving $d_{11} < d_{12} + d'_{12}$. Then, due to QoS-based late service binding, S_{12} gets selected and the end-to-end QoS is worsened, from $[\max(d_{11}, d_{21} + d_{22}), low]$ to $[\max(d_{12} + d'_{12}, d_{21} + d_{22}), low]$. Thus, an improvement in the QoS of some service has resulted in a degradation in the end-to-end QoS of the orchestration. □

Running example 4 illustrates the lack of *monotonicity* with respect to QoS, in that a site improving its own QoS may result in a degradation of the end-to-end QoS of the orchestration. Which counter-measure could be considered to avoid this? Of course, making choices on the basis of end-to-end global optimization of the QoS is monotonic by definition. It does not fit the area of composite services, however, where on-line dynamic service binding is preferred.

Running Example 5. For our example, one may argue that deciding between a_{11} and a_{12} is questionable; it would rather make sense to compare S_{11} with S_{12} as a whole, whose QoS equals $[d_{12} + d'_{12}, low]$. Mononicity would be recovered after this aggregation, but at the price of postponing the decision. □

To allow for an understandable and agreed management of service orchestrations, monotonicity is required when performing QoS based service binding, negotiation and reconfiguration. The failure to be monotonic is not a pathological situation for an orchestration, however. It is, indeed, often encountered. The more so when orchestrations are specified using rich languages such as BPEL or Orc. It is not uncommon that a failure to be monotonic is not easy identifying.

Despite the prevalence of on-line decisions and reconfigurations in the area of composite services, the issue of monotonicity has not been properly acknowledged in the literature. The only exceptions we are aware of are [2, 3, 24], where *global* versus *local* QoS optimization is studied—local optimization corresponds to our optimal late service binding.

In this paper we address in a general setting the issues discussed in our running example. By encompassing AES (or contextual nets) with arbitrary confusion, we handle general orchestrations—we, however, require that executions are all finite; if not so, evaluating the end-to-end QoS makes no sense. We propose an algebraic framework for QoS generalizing the calculus developed in our running example. We explain how the end-to-end QoS of an orchestration can be defined and computed. We study monotonicity by providing conditions ensuring it and counter-measures to overcome the lack of it.

We use AES for our mathematical developments. The notion of AES was introduced in the companion paper [1] and we recall the corresponding notations in Figure 2. Our running example was presented using contextual nets. The companion paper [1] recalls how every contextual net defines an associated AES.

E	shorthand for AES (E, \leq, \nearrow) where \nearrow denotes the asymmetric conflict
$[e]$	$= \{x \in E \mid x \leq e\}$, with e an event of AES E
$\text{Conf}(E)$	the set of configurations of AES E
$\overline{\text{Conf}(E)}$	the set of maximal configurations of AES E
$\text{CC-Conf}(E)$	the set of CC-configurations of AES E
α, β	notations for branching cells
$C \vdash_E \alpha$	configuration C of E enables the branching cell α

Figure 2: Notations for Asymmetric Event Structures and Branching Cells

2. QoS Domains

In this section we formalize QoS Domains. The reader is referred to our running example of Figure 1, where motivations for the forthcoming definitions were given:

Definition 2.1. A QoS domain is a tuple $\mathbb{Q} = (Q, \preceq, \oplus)$ where:

- (Q, \preceq) is a complete upper semi lattice; in other words, (Q, \preceq) is a partially ordered set such that every subset $S \subseteq Q$ has a least upper bound denoted by $\bigvee S$. For any $S \subseteq Q$, we respectively denote by $\min(S)$ and by $\max(S)$ the set of minimal, respectively of maximal elements of S .
- (Q, \oplus) is a commutative semi-group with neutral element 0 and such that:

$$(\text{monotonicity}) \quad (q_1 \preceq q'_1) \wedge (q_2 \preceq q'_2) \Rightarrow (q_1 \oplus q_2) \preceq (q'_1 \oplus q'_2) \quad (3)$$

$$\forall q, q' \in Q \quad \exists q'' \in Q : \quad q \preceq q' \oplus q'' \quad (4)$$

Referring to our motivating discussion: Q is the set in which QoS takes its values; $q \preceq q'$ is interpreted as “ q is better than (or preferred to) q' ”; partial order \preceq gives rise to the least upper bound \vee , interpreted as the worst QoS; operator \oplus is used to accumulate QoS quanta from causally related events. Examples of QoS domains include:

- *Latency or Response Time*: the end-to-end QoS of a configuration gives the accumulated latency d , or “delay” of this configuration. Corresponding QoS domain is $Q = \mathbb{R}_+$, equipped with $\oplus_d = +$, and \preceq_d is the usual order on \mathbb{R}_+ . This is the basic example of QoS metric, which was studied in [6].
- *Security Level*: the QoS domain is $(Q_s, \preceq_s, \oplus_s)$, where $Q_s = \{\text{high}, \text{low}\}$ with $\text{high} \preceq_s \text{low}$, $\oplus_s = \vee_s$ reflecting that a low security service processing a high security data yields a low security response. More complex partially ordered security domains can be handled similarly.

We do not claim that this solves security in orchestrations. It only serves a more modest but nevertheless useful purpose, namely to propagate and combine security levels of the requested services to derive the security level of the orchestration. How security levels of the requested services is established is a separate and more difficult issue, addressed, e.g., by relying on reputation or through the negotiation of security contracts. Here we assume that services expose this information.

- *Reliability*: the QoS domain is as for Security Level, except that high/low is replaced by nominal/faulty. By equipping this QoS domain with probability distributions (see the discussion in Section 6), we capture reliability in our setting.

Running Example 6. Running Example 2 uses *multi-dimensional QoS*, namely *latency* and *security level*, considered jointly. So, for our running example, $Q = Q_s \times Q_d$ equipped with the product order. \square

Our model of a QoS domain is very close to the approach of Buscemi and Montanari (2011) [8], Buscemi and Montanari (2007) [7], De Nicola et al. (2005) [11]. In this set of works, generic QoS is supported through a commutative semi-ring algebra bearing tight similarities with (Q, \preceq, \oplus) —the only difference is the technical “archimedian” condition (4), which is used in the study of monotonicity. The *cc-pi calculus* [7] was proposed to model dynamic service binding with QoS-based selection and its expressiveness is studied.

3. Performance AES and On-line Optimal Processes

In this section we develop the framework of Performance AES to model composite service execution with QoS-based dynamic service binding.

3.1. Performance AES and QoS of Configurations

The notion of Performance AES introduced below is a natural framework to relate causality processes with asymmetric conflict with QoS of service calls, captured by QoS domains introduced in the previous section.

Definition 3.1. A Performance AES (P-AES) is a tuple $\mathcal{P} = (E, \mathbb{Q}, \lambda_0, \lambda)$, E is a finite AES, $\mathbb{Q} = (Q, \preceq, \oplus)$ is a QoS domain, $\lambda_0 \in Q$ is the initial QoS capturing the activation of the P-AES, and the total function $\lambda : E \rightarrow Q$ is the QoS label, which associates, to each event, a QoS quantum.

Our first task is to relate the end-to-end QoS of the composite service to the QoS label λ attached to each individual service call. This is captured by the notion of end-to-end QoS of a configuration (see (1) and (2) of our running example), justified by the following theorem:

Theorem 3.2. Let E be an AES, Q a QoS domain and let $\lambda : E \rightarrow Q$ be any given function. Then there exists a unique function $\Lambda : \text{Conf}(E) \rightarrow Q$, called the end-to-end configuration QoS, such that, for any configuration C and any event e :

$$\begin{aligned} \Lambda(\emptyset) &= \lambda_0 \\ \Lambda(C) &= \bigvee_{e \in L(C)} \Lambda([e]) \text{ if } C \neq \emptyset \\ \Lambda([e]) &= \lambda(e) \oplus \Lambda([e] \setminus \{e\}) \end{aligned} \quad (5)$$

where $L(C)$ denotes the set of maximal events of C for the causality order \leq of E (the “top layer” of C). Moreover this function satisfies the following monotonicity property, for C, C' any two configurations:

$$C \subseteq C' \implies \Lambda(C) \preceq \Lambda(C'). \quad (6)$$

We observe that Λ in Theorem 3.2 is given by two coupled definitions. We thus need to prove that such a definition makes sense and uniquely defines Λ . The proof is found in Appendix A.1.

Thus, for $\mathcal{P} = (E, \mathbb{Q}, \lambda)$ a P-AES, Theorem 3.2 uniquely defines the end-to-end QoS of any configuration C , we denote it by $\Lambda_{\mathcal{P}}(C)$ in the sequel.

Running Example 7. Running Example 3 discusses, for the different executions that can occur in the orchestration of Figure 1, how the end-to-end QoS is computed according to formulas (5). \square

3.2. On-line Optimization of the QoS

For X any set and any map $\varphi : X \rightarrow Q$, the notation

$$(\min, \arg \min) \{ \varphi(x) \mid x \in X \} \quad (7)$$

denotes a *Pareto minimum*, i.e., any pair $(x, \varphi(x))$ such that no $x' \in X$ exists with $\varphi(x') \prec \varphi(x)$. Pareto minima or maxima are thus not uniquely defined.

QoS-based service selection is a typical operation in composite services. A straightforward policy is the *a posteriori* best service selection, which consists in finding:

$$(\mathcal{Q}_{\text{opt}}(\mathcal{P}), C_{\text{opt}}(\mathcal{P})) = (\min, \arg \min) \left\{ \Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}(E)} \right\} \quad (8)$$

in the sense of (7). Policy (8) is, however, not appropriate in a dynamic world of services. On-line late service binding is preferred, which consists in on-line selecting, at run time, one service among the enabled ones, based on its QoS. We thus abandon policy (8) and replace it by an on-line selection policy with

no backtrack, in which a selection among competing services occurs each time the due information is at hand for this selection to be sound.

Choosing among competing alternatives can only be performed at certain stages of the execution, where the due information for consistently identifying the possible alternative continuations is available. The *CC-configurations* introduced in companion paper [1] identifies the subclass of configurations where such a choice can be properly made. *Branching cells*, also introduced in [1], identify the minimal sets of events involved in such a choice. A key result of [1] states that any maximal configuration C is covered by the branching cells capturing the successive choices made when executing it: $C \subseteq \uplus_n \alpha_n$; furthermore, its prefixes of the form $C_n = C \cap (\uplus_{m \leq n} \alpha_m)$ are the CC-configurations converging to C (the convergence occurs in finitely many steps).

Thus, in our framework, choosing among competing alternatives consists in extending a CC-configuration by means of a branching cell and then choosing a maximal configuration of the latter. The procedure we develop next formalizes this—we used it in our running example of Section 1. Recall that $L(C)$ denotes the set of maximal events of C for the causality order \leq of E , i.e., the “top layer” of C :

Procedure 1 (execution with late service binding). *Execute the following loop with initial $\text{Data} := (\emptyset, \emptyset)$ in order to maintain the set*

$$\Lambda_{\mathcal{P}}((C)) \quad =_{\text{def}} \quad \{\Lambda_{\mathcal{P}}(\lfloor e \rfloor) \mid e \in L(C)\} \text{ for } C \in \text{CC-Conf}(E),$$

from which the end-to-end QoS of C can be computed by $\Lambda_{\mathcal{P}}(C) = \bigvee \Lambda_{\mathcal{P}}((C))$:

Data: $(C, \Lambda_{\mathcal{P}}((C)))$ with $C \in \text{CC-Conf}(E)$.

1. Select a branching cell α enabled at C in E , i.e., $C \vdash_E \alpha$;
2. Using recursive formula (5), evaluate $\Lambda_{\mathcal{P}}((C \uplus C'))$ for C' ranging over $\text{Conf}(\alpha)$, starting from $C' = \emptyset$, and select a Pareto minimum

$$(\Lambda_{\mathcal{P}}(C_*), C_*) = (\min, \arg \min) \left\{ \Lambda_{\mathcal{P}}(C \uplus C') \mid C' \in \overline{\text{Conf}(\alpha)} \right\}.$$

3. If $C \uplus C_*$ is a maximal configuration, then stop the loop; else compute $\Lambda_{\mathcal{P}}((C \uplus C_*))$ and restart from Step 1 with

$$\text{Data} := (C \uplus C_*, \Lambda_{\mathcal{P}}((C \uplus C_*))).$$

The loop eventually stops when reaching some maximal configuration C_{\max} and we set

$$(\mathcal{Q}_{\text{online}}(\mathcal{P}), C_{\text{online}}(\mathcal{P})) \quad =_{\text{def}} \quad (\Lambda_{\mathcal{P}}(C_{\max}), C_{\max}). \quad (9)$$

Procedure 1 with its formula (9) formalizes QoS-based late service binding and evaluates the resulting end-to-end QoS for the composite service.

Non determinism occurs in Procedure 1 in two distinct places at each round of the loop: in Step 1, when selecting a branching cell among the several branching cells enabled at C ; and in Step 2, since the Pareto minimum is not unique. The following result shows that the first kind of non determinism at least has little influence on the final result of the procedure. See a situation in § 4 and in particular in Theorem 4.5 where both sources of non determinism are uncorrelated.

Proposition 3.3. *Let C be a maximal configuration selected by Procedure 1. Then for any choice of successive branching cells α in Step 1 of the procedure, there is a corresponding choice in Step 2 of the procedure such that the resulting maximal configuration selected is C .*

Proof. Let α be any branching cell selected by Step 1 in the first round of Procedure 1. Proceeding inductively, it suffices to show that there is some optimization choice in Step 2 that precisely picks $C_\alpha = \alpha \cap C$ as optimum. Since α is selected at Step 1, α is an initial branching cell of E of C , and thus is selected at some round, say n , of Step 1 in the loop that produces C . By hypothesis, $C_\alpha = \alpha \cap C$ is selected as a Pareto minimum inside branching cell α in Step 2 of the same round n of the loop. The local form (5) of the function Λ then shows that the very same C_α is a valid candidate for the Pareto optimum in Step 2 of the first Round of the original loop, which proves the lemma. \square

Despite Proposition 3.3, non determinism still arises in formula (9), due to the non uniqueness of the Pareto minimum in step 2. Indeed, formula (9) non deterministically selects a candidate among a subset of QoS values. Remark that the *a posteriori* best selection service given by the optimization problem (8) is also non deterministic, for the same reason that minimal elements are not uniquely defined.

Running Example 8. The discussion of Running Example 3 illustrates how late service binding according to Procedure 1 is performed in our running example, when choosing between the two services S_{11} and S_{12} . \square

3.3. Comparing On-line and Off-line Best Services

Since the *a posteriori* optimization problem (8) contrasts with the on-line selection service given by Procedure 1, we shall call it in the sequel *off-line optimization problem*. The comparison between off-line and on-line optimization services is a natural question.

To compare subsets of QoS values, for $X, X' \subseteq Q$, say that

$$\begin{aligned} X \prec X' & \quad \text{if} \quad \forall q \in X, \exists q' \in X' \text{ such that } q \preceq q' \\ X \preceq X' & \quad \text{if} \quad \forall q' \in X', \exists q \in X \text{ such that } q \preceq q' \end{aligned} \quad (10)$$

(Note the two distinct cases). Using notation (10) the following holds:

Proposition 3.4. *For any P-AES \mathcal{P} , $\mathcal{Q}_{\text{opt}}(\mathcal{P}) \preceq \mathcal{Q}_{\text{online}}(\mathcal{P})$ holds.*

Proof. By definition of $\mathcal{Q}_{\text{opt}}(\mathcal{P})$, we have $\mathcal{Q}_{\text{opt}}(\mathcal{P}) \preceq \{\Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}(E)}\}$. The result follows by observing that $\mathcal{Q}_{\text{online}}(\mathcal{P}) \subseteq \{\Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}(E)}\}$. \square

Finally, the *a posteriori* worst case end-to-end QoS will also be useful considering (we are not interested in the argument of the maximum):

$$\mathcal{Q}_{\text{worst}}(\mathcal{P}) = \max \left\{ \Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}(E)} \right\}. \quad (11)$$

4. The Issue of Monotonicity

A basic assumption underpinning the management of composite services is that QoS improvements in the called services can only be better for the composite service. We refer to this as the *monotonicity* property. Unfortunately, monotonicity is by no means a trivial assumption when late service binding is considered. Observe that Procedure 1 differs from Belmann dynamic programming [5]: the latter is a backward incremental computation of (8), whereas Procedure 1 proceeds forward by short horizon decisions, which may impair monotonicity. In this section we study conditions by which monotonicity still holds under on-line service selection in Procedure 1, we call this property *on-line monotonicity*. This notion was first noticed in [16, 6]. The issue of monotonicity was discussed in Running Example 4.

To formalize this concept we need some further notations. Fix an AES E and a QoS domain \mathbb{Q} . For $\lambda, \lambda' : E \rightarrow \mathbb{Q}$ two QoS labels, write $\lambda \preceq \lambda'$ if and only if, for every $e \in E$, $\lambda(e) \preceq \lambda'(e)$ holds. Monotonicity will depend on both structural conditions on the underlying AES and on the set \mathbb{L} of allowed QoS labels $\lambda : E \rightarrow \mathbb{Q}$.

Definition 4.1 (on-line monotonicity). *Let $(E, \mathbb{Q}, \mathbb{L})$ be a triple consisting of an AES E , a QoS domain \mathbb{Q} , and a set \mathbb{L} of allowed QoS labels. Using the notation introduced in (10), say that (E, \mathbb{Q}) is on-line monotonic if, for any two P-AES $\mathcal{P} = (E, \mathbb{Q}, \lambda_0, \lambda)$ and $\mathcal{P}' = (E, \mathbb{Q}, \lambda'_0, \lambda')$ such that $\lambda, \lambda' \in \mathbb{L}$,*

$$\left. \begin{array}{l} \lambda_0 \preceq \lambda'_0 \\ \lambda \preceq \lambda' \end{array} \right\} \implies \mathcal{Q}_{\text{online}}(\mathcal{P}) \preceq \mathcal{Q}_{\text{online}}(\mathcal{P}') \quad (12)$$

Definition 4.1 expresses that improving the QoS labels of each event improves the end-to-end QoS of the P-AES. The following result follows directly from the properties of QoS domains:

Lemma 4.2. *Using the notations introduced in Definition 4.1, if $\lambda_0 \preceq \lambda'_0$ and $\lambda \preceq \lambda'$ then:*

$$\begin{array}{lcl} \mathcal{Q}_{\text{opt}}(\mathcal{P}) & \preceq & \mathcal{Q}_{\text{opt}}(\mathcal{P}') \\ \mathcal{Q}_{\text{worst}}(\mathcal{P}) & \succeq & \mathcal{Q}_{\text{worst}}(\mathcal{P}') \end{array} \quad (13)$$

Proof. By definition of $\mathcal{Q}_{\text{opt}}(\mathcal{P})$, we have $\mathcal{Q}_{\text{opt}}(\mathcal{P}) \preceq \{\Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}}(E)\}$. By monotonicity of $\lambda \mapsto \Lambda_{\mathcal{P}}(C)$ for any fixed maximal configuration C and \mathcal{P} associated to λ , we get $\{\Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}}(E)\} \preceq \{\Lambda_{\mathcal{P}'}(C) \mid C \in \overline{\text{Conf}}(E)\}$. On the other hand, $\{\Lambda_{\mathcal{P}}(C) \mid C \in \overline{\text{Conf}}(E)\} \preceq \mathcal{Q}_{\text{opt}}(\mathcal{P}')$. Chaining these three \preceq -inequalities yields the second inequality of (13). Similarly, by definition of $\mathcal{Q}_{\text{worst}}(\mathcal{P}')$, we have $\{\Lambda_{\mathcal{P}'}(C) \mid C \in \overline{\text{Conf}}(E)\} \succeq \mathcal{Q}_{\text{worst}}(\mathcal{P}')$, and the rest of the former argument can be repeated, *mutatis mutandis*. \square

Lemma 4.2 expresses that “off-line monotonicity” always holds. In contrast, due to the short horizon decision, Procedure 1 may not guarantee (12); see Running Example 2 in the introduction for a counter-example. The following theorem provides a first criterion for on-line monotonicity:

Theorem 4.3. *$(E, \mathbb{Q}, \mathbb{L})$ is on-line monotonic if, for any initial QoS λ_0 and any QoS label $\lambda \in \mathbb{L}$, applying Procedure 1 to the P-AES \mathcal{P} defined by λ , always returns a Pareto optimum for (8).*

Proof. A direct consequence of Lemma 4.2. \square

The forthcoming Theorem 4.5, has the advantage of stating a *structural* condition on the AES involved. It is convenient to introduce first a definition:

Definition 4.4. Let \mathbb{Q} be a QoS domain, and let $\lambda : E \rightarrow \mathbb{Q}$ and $\lambda' : E' \rightarrow \mathbb{Q}$ be two mappings where E and E' are two AES. A mapping $\psi : E \rightarrow E'$ is an isomorphism of labeled AES between (E, λ) and (E', λ') whenever:

1. ψ is a bijection, and for all $e_1, e_2 \in E$, one has $e_1 \leq e_2 \iff \psi(e_1) \leq \psi(e_2)$ and $e_1 \nearrow e_2 \iff \psi(e_1) \nearrow \psi(e_2)$; and
2. $\lambda' \circ \psi = \lambda$.

We say that (E, λ) and (E', λ') are isomorphic labeled AES if there exists such an isomorphism $\psi : E \rightarrow E'$.

Theorem 4.5. The following condition is sufficient for $(E, \mathbb{Q}, \mathbb{L})$ to satisfy the condition of Theorem 4.3, and hence to be on-line monotonic:

For any labeling function $\lambda \in \mathbb{L}$, for any $C \in \text{CC-Conf}(E)$, for any branching cell α enabled by C , and for any two maximal configurations $W, W' \in \overline{\text{Conf}(\alpha)}$, the futures $E^{C \uplus W}$ and $E^{C \uplus W'}$ equipped with the restrictions of λ to $E^{C \uplus W}$ and to $E^{C \uplus W'}$ respectively, are two isomorphic labeled AES. (14)

The proof is found in Appendix A.2.

Remark 1. Structural condition (14) is very natural if AES E is the unfolding of a safe contextual Petri net¹. In this case, every branching cell is folded as a subset of some cluster—recall that *clusters* are minimal subsets of transitions t and places p of the net satisfying

$$\begin{aligned} \forall t \in \mathbf{c} &\implies \bullet t \subseteq \mathbf{c} \\ \forall p \in \mathbf{c} &\implies p^\bullet \subseteq \mathbf{c} \\ \forall p \in \mathbf{c} &\implies \{t \in \mathcal{T} \mid {}^o t \ni p\} \subseteq \mathbf{c} \end{aligned} \tag{15}$$

where $\bullet n$ and n^\bullet are the preset and postset of node n and ${}^o t$ is the context of transition t , see [4]. The structural condition is in particular satisfied if all clusters \mathbf{c} of this net are such that, for any two transitions $t_1 \neq t_2$ belonging to \mathbf{c} , $t_1^\bullet = t_2^\bullet$ holds. For this case of contextual net unfoldings, the condition $\lambda \circ \psi = \lambda$ from Definition 4.4 expresses that QoS labels are attached to transitions, a very natural condition. \square

It is shown in [6] that, for the particular case where the QoS is the response time (and under a mild condition on \mathbb{L}), the conditions of Theorem 4.5 are also necessary.

¹It is more natural to consider the case of nets when discussing condition (14). The reader is referred to Appendix B of Companion paper [1] for an account on the unfolding of contextual their.

5. Enforcing Monotonicity

Theorem 4.5 provides guidelines regarding how to enforce monotonicity. We illustrate this using our running example of Section 1.

One way of enforcing monotonicity is by invoking Theorem 4.5. Aggregate the two successive transitions a_{12} and b_{12} , which capture the call and response of service S_{12} , respectively. The resulting P-AES satisfies the condition of Theorem 4.5 and thus is on-line monotonic. This was the counter-measure proposed in Running Example 5.

An alternative to the above procedure consists in not modifying the orchestration but rather changing the QoS evaluation procedure. Referring again to Figure 1, isolate the part of the workflow that is a source of non-monotonicity, namely the subnet collecting the events a_{11}, a_{12}, b_{12} . For this subnet, use pessimistic formula (11) to get a pessimistic but monotonic bound for the QoS of this subnet. For this example, the pessimistic bound is equal to

$$[\max(d_{11}, d_{12} + d'_{12}), \max(\textit{high}, \textit{low})].$$

We then plug the result in the evaluation of the QoS of the overall orchestration, by aggregating the isolated subnet into a single transition ab_{12} , with this QoS increment.

The above two procedures yield different results. By aggregating service calls performed in sequence, the first procedure delays the selection of the best branch. The second procedure does not suffer from this drawback. In turn, it results in a pessimistic evaluation of the end-to-end QoS. Both approaches restore monotonicity.

6. Conclusion

By allowing service calls to be guarded by contexts, Asymmetric Event Structures and contextual nets are a convenient framework to model composite Web services or service orchestrations. We have proposed to equip AES with *QoS domains* as a framework to capture a number of QoS metrics and their combination. We used the resulting model to formalize QoS-based late service binding in composite services. Branching cells of AES played a central role in this formalization by localizing choices in a precise way. When subject to QoS-based late service binding, composite services may be non-monotonic with respect to QoS, meaning that strictly improving the QoS of a service may strictly decrease the end-to-end QoS of the composite service, an embarrassing feature for QoS-aware management; we provided sufficient conditions ensuring monotonicity and guidelines for enforcing it.

Now, the QoS offered by services is typically varying and subject to uncertainty. Our framework is prepared for a probabilistic extension dealing with uncertainty, see [16] for an informal presentation of this. By identifying all sources of nondeterminism and then randomizing them, all results developed here extend to the probabilistic setting. This probabilistic extension is essential to capture reliability as proposed in Section 2.

This theoretical investigation paves the way to provide formal support for the separation of concerns in the management of composite services. It would be desirable to see *function* and *QoS* as two cross-cutting “aspects” of a composite service. Each aspect should be developed separately using a “minimal”

specification of the interaction with the other aspect. Weaving these two aspects should return the program specifying the QoS-enhanced composite service. Our generic model of QoS domain should get instantiated for each QoS metric of interest, using a library of predefined QoS classes. A subset of the authors has started the development of a framework supporting all of this on top of the Orc language developed by the team of J. Misra [13], this development will be reported elsewhere.

A. Missing proofs

A.1. Proof of Theorem 3.2

The proof is by induction on the height of a configuration, using the following explicit construction:

1. For $C \in \text{Conf}(E)$, we define the *height* $\tau(C) \in \mathbb{N}$ of C as the longest length of a causality chain in C .
2. For $n \geq 0$ we set $\mathcal{C}_n = \{C \in \text{Conf}(E) \mid \tau(C) \leq n\}$.
3. We define by induction the sequence $(\Lambda_n)_{n \geq 0}$ of mappings $\Lambda_n : \mathcal{C}_n \rightarrow Q$:

$$\begin{aligned} \forall n \geq 0 : \quad \Lambda_n(\emptyset) &= \lambda_0 \\ \forall n \geq 0, \forall C \in \mathcal{C}_{n+1} : \quad \Lambda_{n+1}(C) &= \bigvee_{e \in L(C)} \left(\lambda(e) \oplus \Lambda_n([e] \setminus \{e\}) \right) \end{aligned}$$

4. Finally we put, for $C \in \text{Conf}(E)$:

$$\Lambda(C) = \Lambda_{\tau(C)}(C). \quad (\text{A.1})$$

Lemma A.1. *Let $C \in \text{Conf}(E)$ and $n = \tau(C)$. Then $\Lambda_p(C) = \Lambda_n(C)$ for all integer $p \geq n$. Thus, we have, for any configuration C and any integer n :*

$$n \geq \tau(C) \implies \Lambda(C) = \Lambda_n(C). \quad (\text{A.2})$$

Proof. It suffices to prove by induction on integer $n \geq 0$ the following property:

$$(H_n) : \quad \forall C \in \text{Conf}(E) \quad \forall p \in \mathbb{N} \quad \tau(C) = n \wedge p \geq n \Rightarrow \Lambda_p(C) = \Lambda_n(C).$$

The property is obvious for $n = 0$. Assuming (H_n) holds, let $C \in \text{Conf}(E)$ and p be an integer such that $\tau(C) = n + 1$ and $p \geq n + 1$. Then for any $e \in L(C)$, we have that $\tau([e] \setminus \{e\}) \leq n$, and since $p - 1 \leq n$, it follows from (H_n) that $\Lambda_{p-1}(e) = \Lambda_n(e)$. By definition of Λ_p and of Λ_{n+1} , we calculate thus as follows:

$$\begin{aligned} \Lambda_p(C) &= \bigvee_{e \in L(C)} \left(\lambda(e) \oplus \Lambda_{p-1}([e] \setminus \{e\}) \right) \\ &= \bigvee_{e \in L(C)} \left(\lambda(e) \oplus \Lambda_n([e] \setminus \{e\}) \right) = \Lambda_{n+1}(C), \end{aligned}$$

completing the proof of the induction. \square

Lemma A.2. *The function Λ defined above by $\Lambda(C) = \Lambda_{\tau(C)}(C)$ satisfies formulas (5).*

Proof. Easy using (A.2) and the inductive definition of $(\Lambda_n)_{n \geq 0}$. \square

Lemma A.3. *The function Λ satisfies, for any two configurations C and C' :*

$$C \subseteq C' \implies \Lambda(C) \preceq \Lambda(C'). \quad (\text{A.3})$$

Proof. By induction over $\tau(C)$. \square

Proof of Theorem 3.2. The existence follows from Lemmas A.2 and A.3. For the uniqueness, prove by induction over $\tau(C)$ that, for any Λ satisfying (5), then $\Lambda(C) = \Lambda_n(C)$ for all $C \in \text{Conf}(E)$ of height $\leq n$. \square

A.2. Proof of Theorem 4.5

Proof of Theorem 4.5. We first observe that, if C and C' are two maximal configurations of E , their coverings by branching cells given by Theorem 3.7 of companion paper [1] have the same cardinality, and can be ordered respectively as $\{\alpha_1, \dots, \alpha_n\}$ and $\{\beta_1, \dots, \beta_n\}$, in such a way that, for all $i = 1, \dots, n$, when α_i and β_i are equipped respectively with the restrictions $\lambda|_{\alpha_i}$ and $\lambda|_{\beta_i}$, then $(\alpha_i, \lambda|_{\alpha_i})$ and $(\beta_i, \lambda|_{\beta_i})$ are isomorphic AES.

The proof is thus by induction on the length n of the above coverings:

Induction hypothesis: Theorem 4.5 holds for a covering length $\leq n - 1$.

Let $C = W_1^C \uplus W_2^C \uplus \dots \uplus W_n^C$ be any maximal configuration of E together with its decomposition according to Theorem 3.7 of companion paper [1], and let $\{\alpha_1^C, \dots, \alpha_n^C\}$ be the corresponding covering by branching cells. Recalling that $L(W_1^C)$ denotes the set of maximal events of W_1 for the causality order \leq of E , restrict E to $E^{1,C} =_{\text{def}} L(W_1^C) \uplus E^{W_1^C}$ and then equip $E^{1,C}$ with $\lambda_0^1 = 0$ and $\lambda^1(e) = \lambda(e)$, except for $e \in L(W_1^C)$ for which we set $\lambda^1(e) = \Lambda_{\mathcal{P}}(\lfloor e \rfloor)$. Denote by \mathcal{P}^1 the resulting P-AES.

Lemma A.4. *The following holds, for $C \in \overline{\text{Conf}(E)}$:*

1. *By (14), the P-AES $(E^{1,C}, \lambda|_{E^{1,C}})$ are all isomorphic;*
2. *By Theorem 3.2, $\Lambda_{\mathcal{P}^1}(C|_{E^{1,C}}) = \Lambda_{\mathcal{P}}(C)$;*
3. *The induction hypothesis holds for the futures $(E^{W_1^C}, \mathbb{Q}, \mathbb{L}|_{E^{W_1^C}})$.*

Applying Lemma A.4 for $C = C_{\max}$ a maximal configuration constructed by Procedure 1, we complete the proof by contradiction. Assume that C_{\max} is not Pareto optimal for (8). Then, there exists a maximal configuration C of E such that $\Lambda_{\mathcal{P}}(C) \prec \Lambda_{\mathcal{P}}(C_{\max})$. Hence, at least one of the following two cases must occur:

1. $\Lambda_{\mathcal{P}}(C|_{\alpha_1^C}) \prec \Lambda_{\mathcal{P}}(C_{\max}|_{\alpha_1^{C_{\max}}})$, which would contradict step 2 of Procedure 1;
2. Hence, by property 2 of Lemma A.4, $\Lambda_{\mathcal{P}}(C|_{E^{W_1^C}}) \prec \Lambda_{\mathcal{P}}(C_{\max}|_{E^{W_1^{C_{\max}}}})$ must hold, which would contradict properties 1 and 3 of Lemma A.4.

This completes the proof of Theorem 4.5. \square

References

- [1] S. Abbes. Branching cells for asymmetric event structures, 2013. Companion paper, this issue.
- [2] Mohammad Alrifai and Thomas Risse. Combining global optimization with local selection for efficient qos-aware service composition. In *WWW*, pages 881–890, 2009.
- [3] Danilo Ardagna and Barbara Pernici. Global and Local QoS Guarantee in Web Service Selection. In *Business Process Management Workshops*, pages 32–46, 2005.
- [4] P. Baldan, A. Corradini, and U. Montanari. Contextual Petri nets, asymmetric event structures, and processes. *Information and Computation*, 171(1):1–49, 2001.
- [5] D.P. Bertsekas. *Dynamic Programming and Optimal Control*. Athena Scientific, 2005.
- [6] A. Bouillard, S. Rosario, A. Benveniste, and S. Haar. Monotonicity in service orchestrations. In G. Franceschinis and K. Wolf, editors, *Petri Nets*, volume 5606 of *LNCS*, pages 263–282. Springer, 2009.
- [7] M.G. Buscemi and U. Montanari. CC-Pi: a constraint-based language for specifying service level agreements. In *16th European Conference on Programming*, ESOP’07, pages 18–32. Springer, 2007.
- [8] M.G. Buscemi and U. Montanari. QoS negotiation in service composition. *Journal of Logic and Algebraic Programming*, 80(1):13–24, 2011.
- [9] R. Calinescu, L. Grunske, M. Kwiatkowska, R. Mirandola, and G. Tamburrelli. Dynamic QoS Management and Optimization in Service-Based Systems. *IEEE Transactions on Software Engineering*, 37(3):387–409, may-june 2011.
- [10] Jorge Cardoso, Amit P. Sheth, John A. Miller, Jonathan Arnold, and Krys Kochut. Quality of Service for workflows and Web service processes. *J. Web Sem.*, 1(3):281–308, 2004.
- [11] R. De Nicola, G. Ferrari, U. Montanari, R. Pugliese, E. Tuosto, and J.-M. Jacquet. *Coordination Models and Languages*, chapter A Process Calculus for QoS-Aware Applications, pages 246–252. Springer, 2005.
- [12] D. Kitchin, W.R. Cook, and J. Misra. A language for task orchestration and its semantic properties. In *17th International Conference on Concurrency Theory (CONCUR)*, pages 477–491, 2006.
- [13] J. Misra and W.R. Cook. Computation orchestration: a basis for wide-area computing. *Journal of Software and Systems Modeling*, May 2006.
- [14] M. Nielsen, G. Plotkin, and G. Winskel. Petri nets, event structures and domains, part 1. *Theoretical Computer Science*, 13:85–108, 1981.

- [15] S. Rosario, A. Benveniste, S. Haar, and C. Jard. Probabilistic QoS and soft contracts for transaction based Web services. In *ICWS*, pages 126–133. IEEE Computer Society, 2007.
- [16] S. Rosario, A. Benveniste, S. Haar, and C. Jard. Probabilistic QoS and soft contracts for transaction based Web services orchestrations. *IEEE Transactions on Service Computing*, 1(4), 2008.
- [17] S. Rosario, A. Benveniste, and C. Jard. Flexible probabilistic QoS management of transaction based Web services orchestrations. In *ICWS*, pages 107–114. IEEE, 2009.
- [18] S. Rosario, D. Kitchen, A. Benveniste, W.R. Cook, S. Haar, and C. Jard. Event structure semantics of Orc. In M. Dumas and R. Heckel, editors, *WS-FM*, volume 4937 of *LNCS*, pages 154–168. Springer, 2007.
- [19] OASIS Standard. Web Services Business Process Execution Language Version 2.0. Technical report, April, 2007. Available from <http://docs.oasisopen.org/wsbpel/2.0/wsbpel-v2.0.pdf>.
- [20] W.M.P. van der Aalst. Verification of workflow nets. In *ICATPN*, pages 407–426, 1997.
- [21] W.M.P. van der Aalst, A.H.M. ter Hofstede, B. Kiepuszewski, and A.P. Barros. Workflow patterns. *Distrib. Parallel Databases*, 14(1):5–51, 2003.
- [22] W.M.P. van der Aalst and K.M. van Hee. *Workflow Management: Models, Methods, and Systems*. MIT Press, 2002.
- [23] Tao Yu and Kwei-Jay Lin. Service Selection Algorithms for Composing Complex Services with Multiple QoS Constraints. In *ICSOC*, pages 130–143, 2005.
- [24] Liangzhao Zeng, Boualem Benatallah, Anne H. H. Ngu, Marlon Dumas, Jayant Kalagnanam, and Henry Chang. QoS-Aware Middleware for Web Services Composition. *IEEE Trans. Software Eng.*, 30(5):311–327, 2004.
- [25] Liangzhao Zeng, Anne H. H. Ngu, Boualem Benatallah, Rodion M. Podorozhny, and Hui Lei. Dynamic composition and optimization of Web services. *Distributed and Parallel Databases*, 24(1-3):45–72, 2008.